

An aerial photograph of the New York City skyline during sunset. The sky is a mix of orange, yellow, and light blue. The city is densely packed with skyscrapers of various heights and colors. The Empire State Building is a prominent feature on the right side of the image. The water of the harbor is visible in the distance.

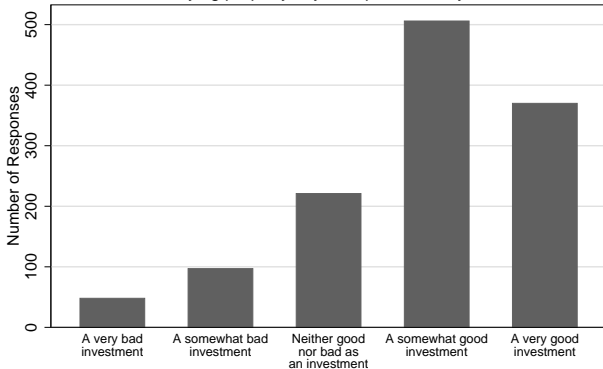
Social Networks and Housing Markets

Johannes Stroebel, New York University

Motivation

- Mounting evidence that people disagree about whether buying a house is a good investment

If someone had a large sum of money that they wanted to invest, would you say that relative to other possible financial investments, buying property in your zip code today is:



- What are the drivers of this disagreement?

Motivation

- Growing sense that social dynamics might affect house prices:
 - Shiller (2008): *"People were excessively optimistic about housing investments; this optimism was part of a social epidemic."*
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- **Recent Research:** Bailey, Cao, Kuchler and Stroebel (JPE, 2018):
 - ① Individuals discuss property investments with friends, and adjust their expectations based on house price experiences within social network.
 - ② By influencing expectations, social interactions have a large effect on individual-level housing investment decisions:
 - Extensive margin
 - Intensive margin
 - Willingness to pay

Social Network Data from Facebook

- Facebook largest global and U.S. online social network
 - $\sim 60\%$ of U.S. adults regularly use Facebook.
- Observe anonymized snapshot of *social graph* of friendship links.
 - Average user in sample: 420 friendship links
 - $>90\%$ have met more than once in real life.
- Demographics, including county-level location.

Empirical Strategy and Data

**Friends' House Price
Experiences**

Social Interactions



**Beliefs about Local Housing
Market Investments**

Empirical Strategy and Data

Friends' House Price Experiences

Facebook Social Graph
+ House Price Movements
in Friends' Location

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Beliefs about Local Housing Market Investments

Survey on Facebook,
1,242 Responses

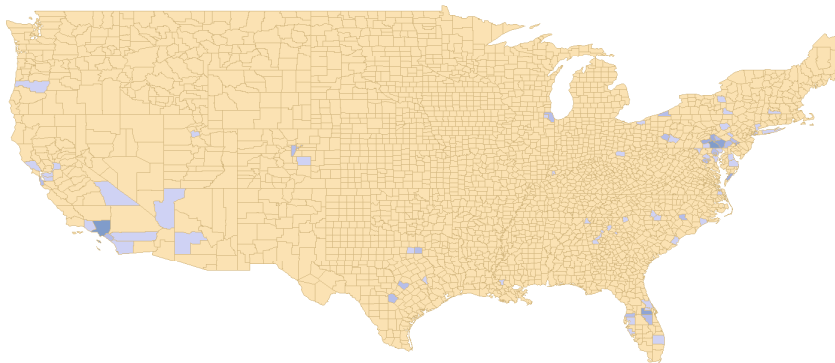
Friends' House Price Experiences

$$FriendHPExp_{i,t,t-24m} = \sum_c ShareFriends_{i,c} \times \Delta HP_{c,t,t-24m}$$

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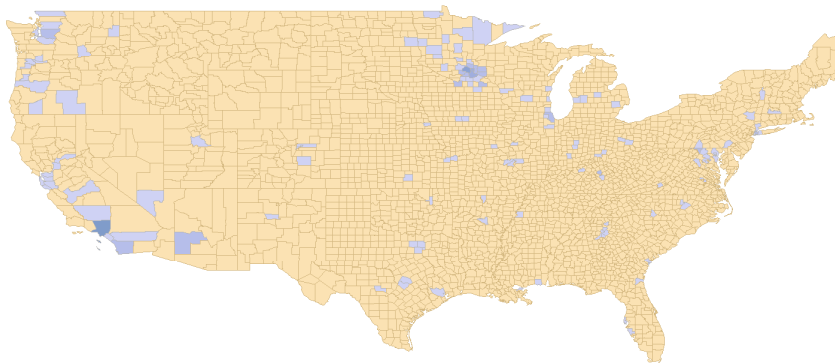
- Example: LA resident I



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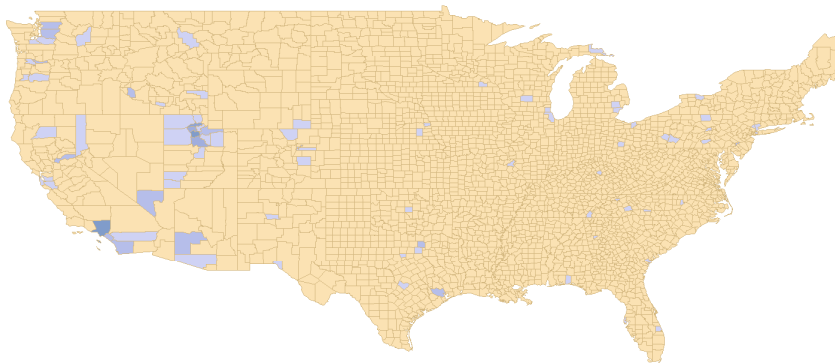
- Example: LA resident II



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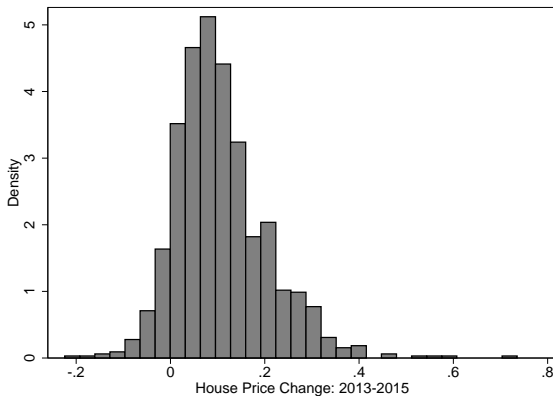
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- Example: LA resident III



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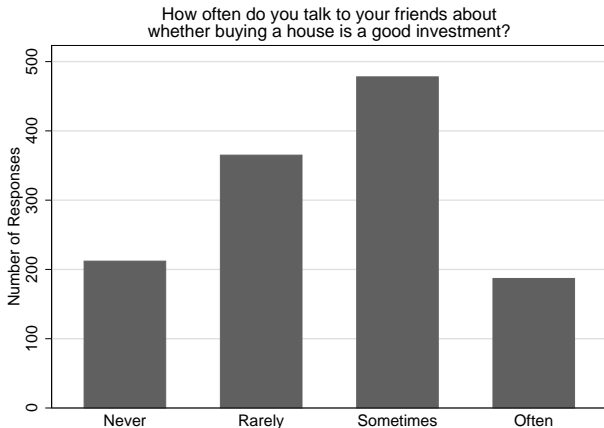


Housing Survey

- November 2015: Target FB users through newsfeed; 1,242 responses
- Focus on a few LA zip codes; Fairly representative demographics

Housing Survey

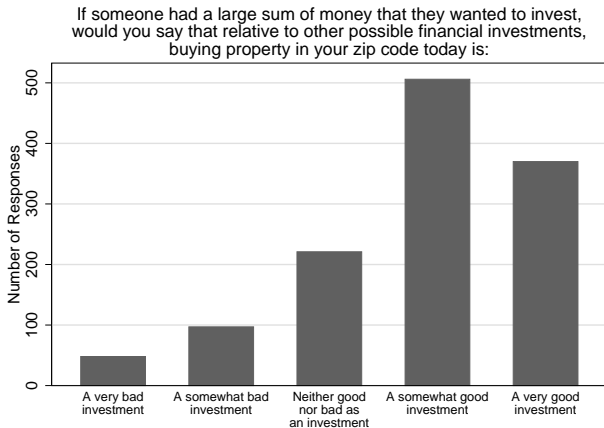
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- Housing investment regularly topic of discussion within social network.

Housing Survey

- November 2015: Target FB users through newsfeed; 1,242 responses
- Focus on a few LA zip codes; Fairly representative demographics



- Substantial dispersion in beliefs within the same housing market.

Housing Survey

$$\text{SurveyExpectations}_{i,t} = \alpha + \beta \text{FriendHPExp}_{i,t,t-24m} + \gamma \mathbf{X}_{i,t} + \epsilon_{i,t}$$

Housing Survey

$$\text{SurveyExpectations}_{i,t} = \alpha + \beta \text{FriendHPExp}_{i,t,t-24m} + \gamma \mathbf{X}_{i,t} + \epsilon_{i,t}$$

	(1)	(2)	(3)
	IV	IV	IV
All Friend Appreciation 2013-15 (%)	0.040** (0.017)	0.036* (0.019)	
Friend Appreciation 2013-15 (%) x Talk with Friend about Housing Investment			
<i>Never</i>			-0.050 (0.038)
<i>Rarely</i>			0.001 (0.028)
<i>Sometimes</i>			0.086*** (0.027)
<i>Often</i>			0.096** (0.049)
Demographic Controls	Y	Y	Y
Zip Code Fixed Effects	Y	Y	Y
Sample		LA in 2012	
N	1,242	1,110	1,242

- Larger effect of friends' experiences when talking more about housing.

Friend Experiences and Housing Market Expectations

**Geographically-Distant Friends'
House Price Experiences**

Facebook Social Graph
+ House Price Movements
in Friends' Location

Social Interactions



**Beliefs about Local Housing
Market Investments**

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**Beliefs about Local Housing
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**Individual Housing Market
Investments**

Empirical Strategy and Data

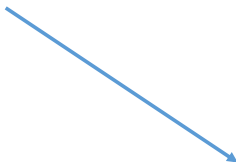
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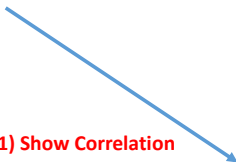
Social Interactions



**Beliefs about Local Housing
Market Investments**

1) Show Correlation

**2) Argue Effect Through
No Other Channel
Except Expectations**



**Individual Housing Market
Investments**

LA county deeds data,
100,000s of observations

Effects on Housing Market Behavior

Having friends who experience a 5 percentage point higher house price experience over the previous two years:

- Increase probability that a renter buys a house over next two years by 3 percentage points
 - Relative to baseline probability of 18 percentage points
 - About half the effect size of having a kid
- Increases square footage by 1.6%
- Conditional on the type of house you buy, increases price paid by 2.3%

Rational Behavior?

- Why are individuals influenced by the house price experiences of their friends?
 - Social learning? FOMO?
- Hard to rule out fully rational behavior, but three thoughts:
 - ① Effect is (weakly) declining in education levels.
 - ② Effect is independent of the true informativeness of network house price experience for future LA house prices.
 - ③ House prices across the country available for free and in real time.

Summary of Individual-Level Findings

What have we learned?

- ① Individuals discuss property investments with friends, and adjust their expectations based on house price experiences within social network.
- ② By influencing expectations, social interactions have a large effect on individual-level housing investment decisions:
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Summary of Individual-Level Findings

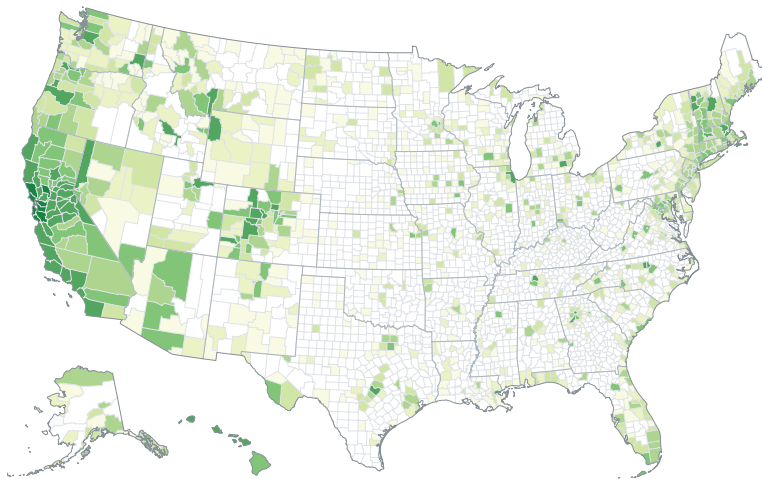
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Does this affect county-level house prices, or does this average out across people within counties?

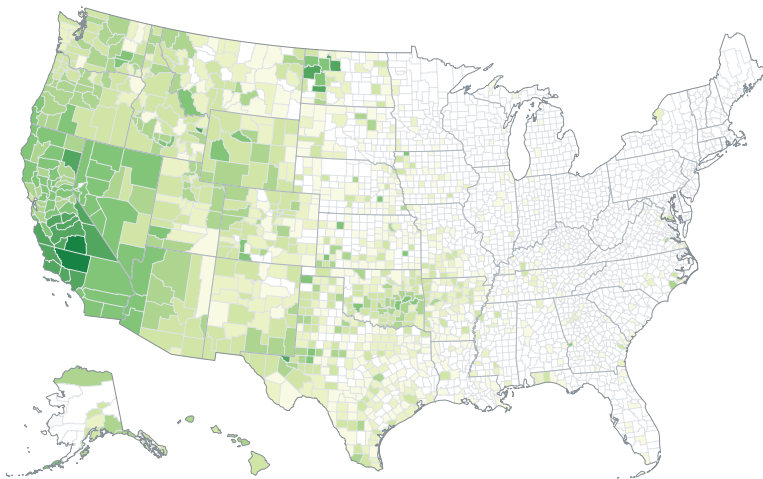
- Move from individual level to county level
- Need to measure county-level social connectedness
- Introducing the “Social Connectedness Index”

San Francisco County, CA



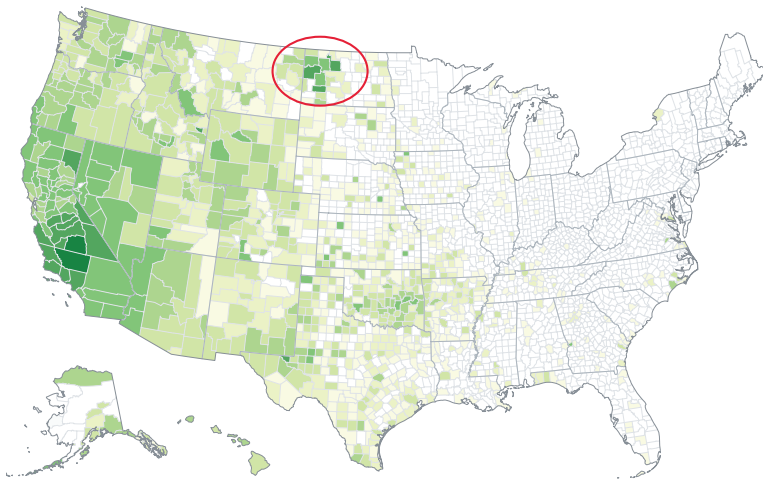
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Kern County, CA (Bakersfield)



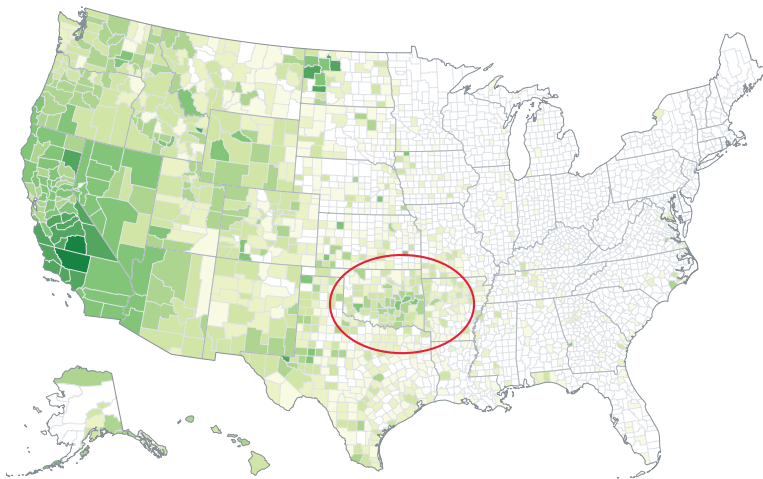
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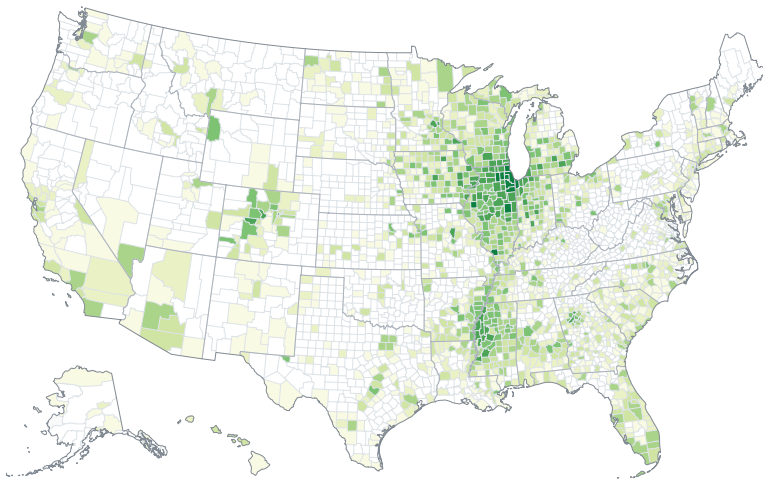
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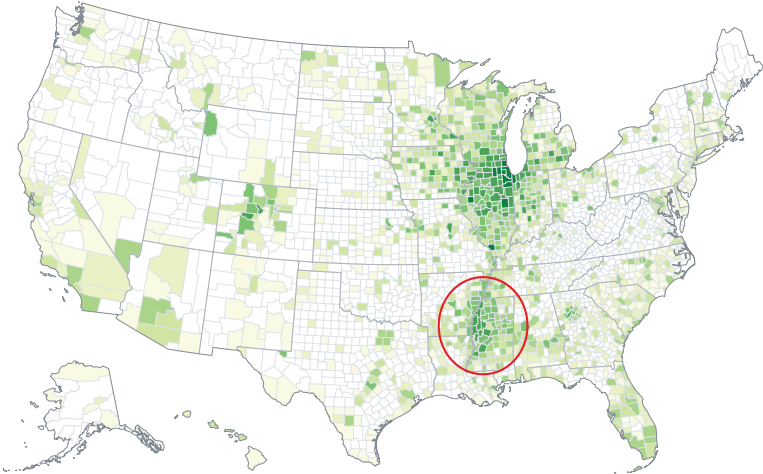
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Cook County, IL (Chicago)



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Summary of County-Level Findings

- Use this data to measure county-level social connectedness
- Show that when house prices in socially-connected counties have risen, this predicts future house price increases in own county
- Data available: Send 1-page research proposal to sci_data@fb.com.

High-Level Conclusions

- People's beliefs about whether buying a house is a good investment are driven by the house price experiences of their friends
- Through this channel, social interactions have a large effect on home purchasing behavior and even aggregate house prices